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# **Molecular Simulation Research Projects**

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## **Introduction to Molecular Dynamics**

**Prof Tina Düren, [t.duren@bath.ac.uk](mailto:t.duren@bath.ac.uk), 9West 3.02**

**Dr Carmelo Herdes, [c.e.herdes.moreno@bath.ac.uk](mailto:c.e.herdes.moreno@bath.ac.uk), WH 7.19**

**Dr Matthew Lennox, [m.j.lennox@bath.ac.uk](mailto:m.j.lennox@bath.ac.uk), 9West 2.04B**

# Molecular Dynamics is easy (in principle)

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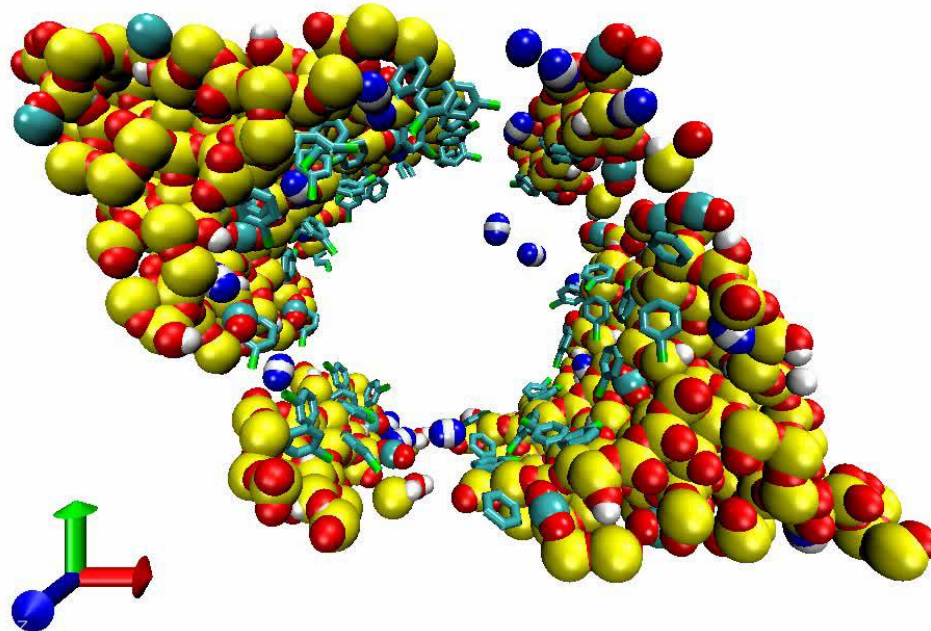
$$\mathbf{F} = m \frac{d^2 \mathbf{r}}{dt^2}$$

- Compute the forces on acting on a particle
- Integrate Newton's equation of motion to get trajectories
- Sample for desired properties every now and then.

# An example

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Finding optimal surface groups for CO<sub>2</sub> capture applications

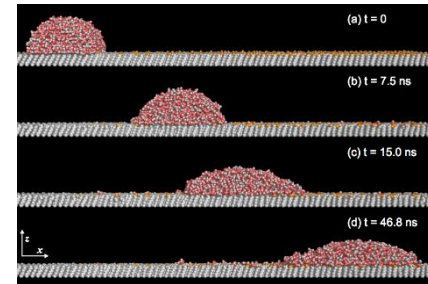


Jennifer Williams, Tina Düren

# What else is MD used for?

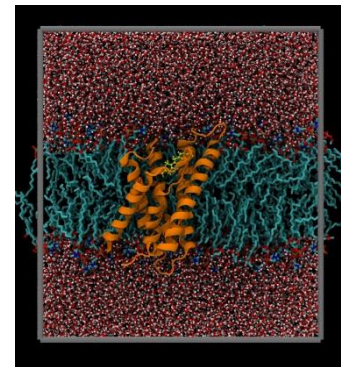
- Materials property prediction  
e.g. bulk modulus, surface tension, shear viscosity, thermal conductivity
- Biomolecular modelling  
e.g. protein folding, cell membranes, ion transport
- Ligand and drug design  
e.g. docking, interaction, sterics
- High-throughput molecular screening  
e.g. drugs, surfactants, self-assembling materials

Wetting



<http://lisgi1.engr.ccnycuny.edu/jkres.htm>

Protein in lipid bilayer



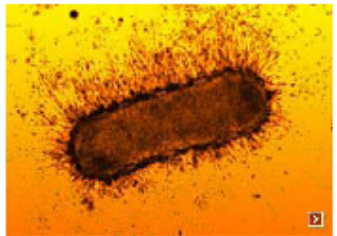
<http://www.molecular-simulation.org/thit.html>

# What length scales are we dealing with?



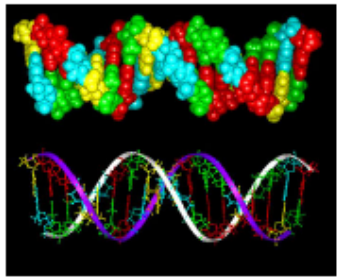
## Macroscale

- Time  $> 1\text{ s}$
- Lengthscale  $> 1\mu$
- Phase field models, FEM



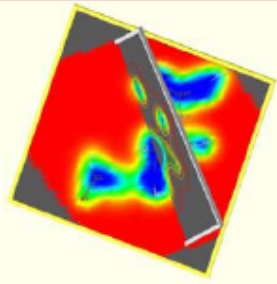
## Mesoscale

- Time  $\sim 10^{-8} - 10^{-2}\text{ s}$
- Lengthscale  $\sim 10\text{-}1000\text{ nm}$
- DPD, coarse-graining



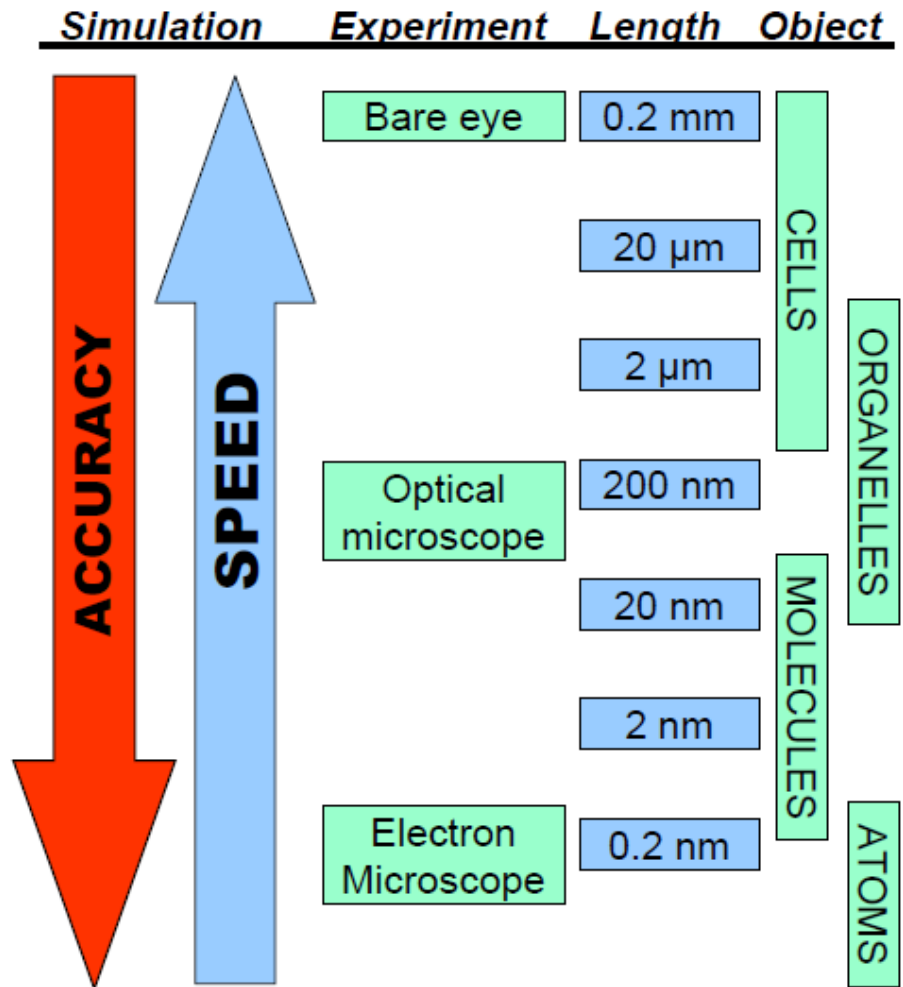
## Nanoscale

- Time  $\sim 10^{-15} - 10^{-9}\text{ s}$
- Lengthscale  $\sim 0.1 - 10\text{ nm}$
- Molecular dynamics, Monte Carlo



## Subatomic scale

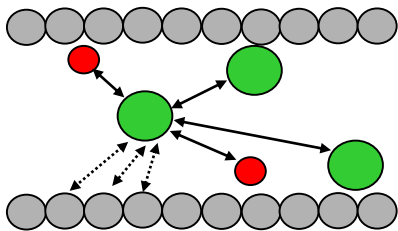
- Electronic structures
- *Ab initio*



# What is Molecular Dynamics?

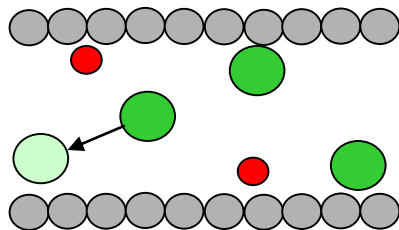
- In MD, we model the motion of some group of particles (e.g., atoms) by solving the classical equations of motion.

1. Calculate the force acting on a molecule

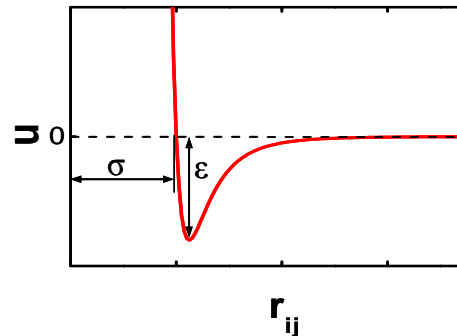


$$\begin{aligned}\frac{d^2 \mathbf{r}_i(t)}{dt^2} &= \frac{1}{m_i} \mathbf{f}_i(t) \\ &= -\frac{1}{m_i} \frac{\partial U(\mathbf{r}^N)}{\partial \mathbf{r}_i}\end{aligned}$$

2. Integrate Newton's equations of motion to get new position



Remember: e.g. Lennard Jones potential to describe interaction between two particles



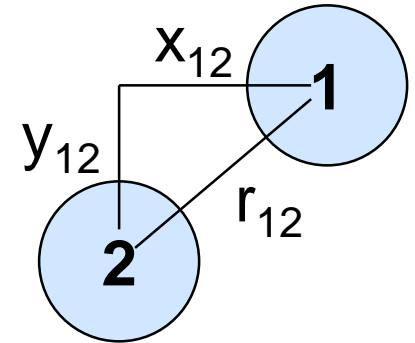
$$u(r_{ij}) = 4\epsilon \left[ \left( \frac{\sigma}{r_{ij}} \right)^{12} - \left( \frac{\sigma}{r_{ij}} \right)^6 \right]$$

# Force calculations

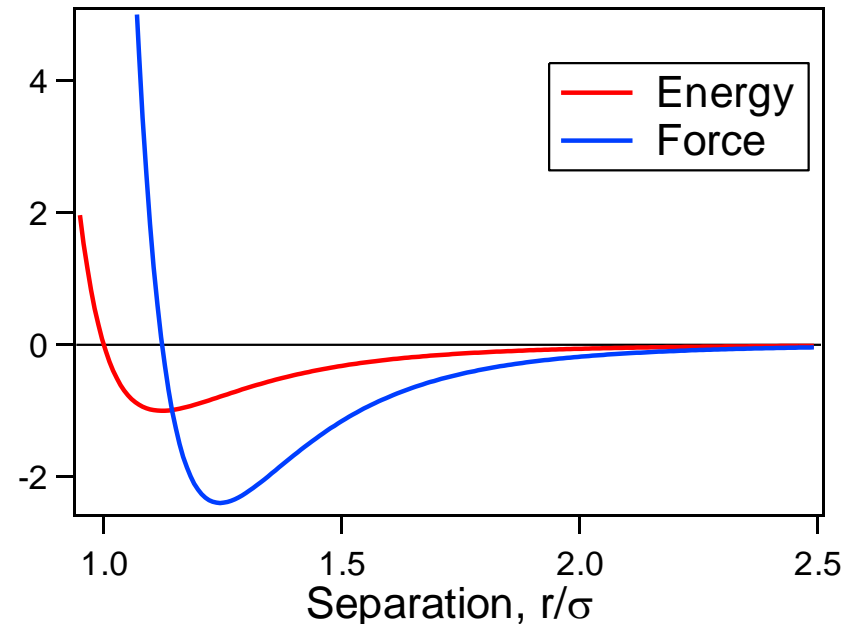
- Force is the gradient of the potential

$$\begin{aligned}
 \mathbf{F}_{2 \rightarrow 1} &= -\nabla u(r_{12}) \\
 \text{Force on 1,} &= -\frac{\partial u(r_{12})}{\partial x_1} \mathbf{e}_x - \frac{\partial u(r_{12})}{\partial y_1} \mathbf{e}_y \\
 \text{due to 2} & \\
 &= -\frac{du(r_{12})}{dr_{12}} \left[ \frac{\partial r_{12}}{\partial x_1} \mathbf{e}_x + \frac{\partial r_{12}}{\partial y_1} \mathbf{e}_y \right] \\
 &= -\frac{f(r_{12})}{r_{12}} \left[ x_{12} \mathbf{e}_x + y_{12} \mathbf{e}_y \right]
 \end{aligned}$$

$$\mathbf{F}_{2 \rightarrow 1} = -\mathbf{F}_{1 \rightarrow 2}$$



$$r_{12} = \left[ (x_2 - x_1)^2 + (y_2 - y_1)^2 \right]$$



# Cutting off the potential

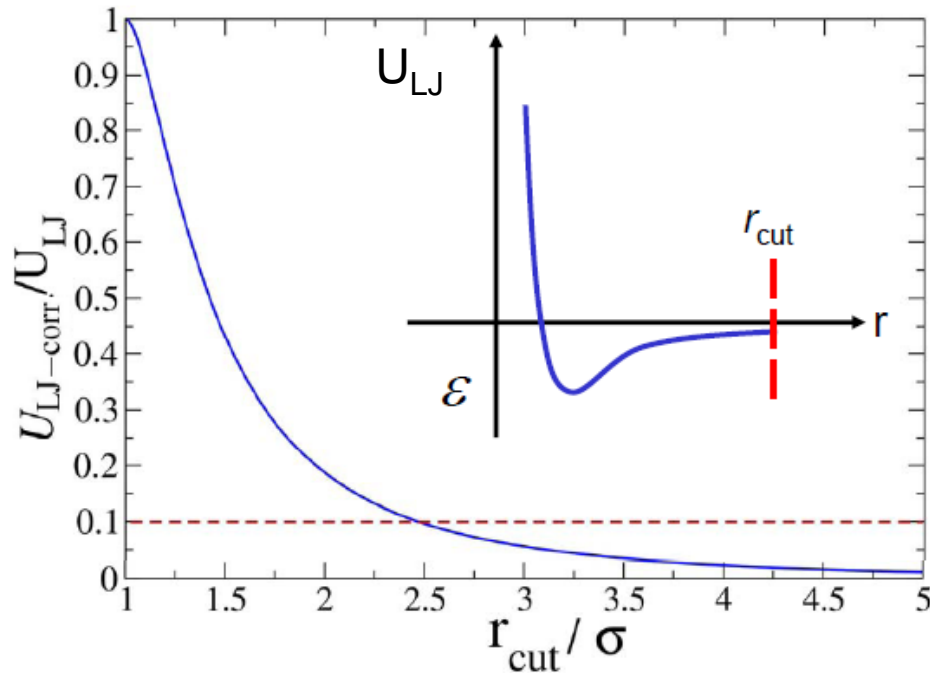
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- For an  $N$  particle system, we need to perform  $N(N-1)/2$  force calculations.
- Luckily, most potentials are (relatively) short ranged and contributions from particles that are further away can be neglected.
- Consider interactions only if particles are closer than some cut-off radius  $r_{\text{cut}}$ .
- The error can be made arbitrarily small by choosing a large cut-off radius.



# Truncation error

## At $2.5\cdot\sigma$ error in energy is $\sim 10\%$



$U_{LJ}$ : Lennard Jones potential truncated at  $r_{cut}$ .

$U_{LJ-corr}$ : truncated Lennard Jones potential corrected with tail correction

- Can I live with that?
- Increase the cut-off radius?
- Use tail corrections?

Increase in computational effort

Depends on application

# Ways to truncate the potential

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- Simple truncation = ignore all interactions beyond  $r_{cut}$

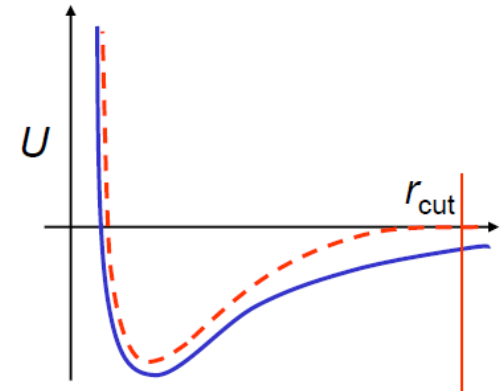
$$u^{trunc}(r) = \begin{cases} u^{LJ}(r) & r \leq r_{cut} \\ 0 & r > r_{cut} \end{cases}$$

- Very often used for Monte Carlo simulations.
- Unsuitable for MD simulations as potential changes discontinuously at  $r_{cut}$ . This will result in an infinite force at the discontinuity.

# Truncated and shifted potential

- The potential is truncated and shifted such that the potential vanishes at the cut-off radius

$$u^{tr-sh}(r) = \begin{cases} u^{LJ}(r) - u^{LJ}(r_{cut}) & r \leq r_{cut} \\ 0 & r > r_{cut} \end{cases}$$



- Most commonly used approach in MD.

# Integrating the equations of motion

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- Desirable features of an integrator
  - minimal need to compute forces (a very expensive calculation)
  - good stability for (relatively) large time steps
  - good accuracy
  - conserves energy and momentum

# Verlet algorithm

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- Very simple, very good, very popular algorithm
- Consider expansion of coordinate forward and backward in time

$$\mathbf{r}_i(t + \Delta t) = \mathbf{r}_i(t) + \mathbf{v}_i(t)\Delta t + \frac{\mathbf{f}_i(t)}{2m_i} \Delta t^2 + \frac{\overset{\dots}{\mathbf{r}}_i(t)}{3!} \Delta t^3 + O(\Delta t^4)$$

$$\mathbf{r}_i(t - \Delta t) = \mathbf{r}_i(t) - \mathbf{v}_i(t)\Delta t + \frac{\mathbf{f}_i(t)}{2m_i} \Delta t^2 - \frac{\overset{\dots}{\mathbf{r}}_i(t)}{3!} \Delta t^3 + O(\Delta t^4)$$

- Which results in

$$\mathbf{r}_i(t + \Delta t) = 2\mathbf{r}_i(t) - \mathbf{r}_i(t - \Delta t) + \frac{\mathbf{f}_i(t)}{m} \Delta t^2 + O(\Delta t^4)$$

# Verlet algorithm illustrated

$$\mathbf{r}_i(t + \Delta t) = 2\mathbf{r}_i(t) - \mathbf{r}_i(t - \Delta t) + \frac{\mathbf{f}_i(t)}{m} \Delta t^2 + O(\Delta t^4)$$

	$t - \Delta t$	$t$	$t + \Delta t$
$\mathbf{r}$			
$\mathbf{v}$			
$\mathbf{F}$			

current position and position at end of previous time step known

	$t - \Delta t$	$t$	$t + \Delta t$
$\mathbf{r}$			
$\mathbf{v}$			
$\mathbf{F}$			

Use them to compute the force at the current position

	$t - \Delta t$	$t$	$t + \Delta t$
$\mathbf{r}$			
$\mathbf{v}$			
$\mathbf{F}$			

Use all three to compute the new position, repeat

- Calculation of new position without consulting velocity
- Velocities can be calculated from finite difference

$$\mathbf{v}_i(t) = \frac{\mathbf{r}_i(t + \Delta t) - \mathbf{r}_i(t - \Delta t)}{2\Delta t} + O(\Delta t^2)$$

- Biggest disadvantage: Calculated velocities lag behind by one time step

# Large time steps lead to energy drifts

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- For any time step, numerical errors that accumulate result in long-term “energy drift” – an exponential increase in energy for very large number of integration steps.
- Typically,  $\Delta t^* = 0.005$  required for stability

$$t^* = \frac{t}{\sigma \sqrt{\varepsilon / m}}$$

- For argon limit of stability  $\Delta t = 10$  fs (1 fs =  $10^{-15}$  s)
- For more complex systems,  $\Delta t = 1 - 2$  fs

# More advanced integration schemes

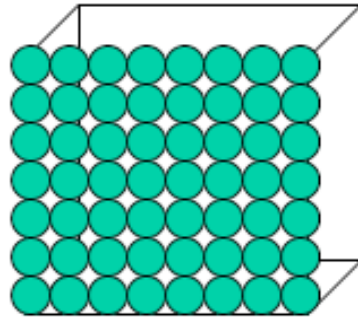
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- Leapfrog (default in gromacs)
- Velocity Verlet
- Predictor / Corrector methods



# Boundary effects

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- In small systems, boundary effects are always large.
- 1000 atoms in a simple cubic crystal: 488 boundary atoms.
- 1,000,000 atoms in a simple cubic crystal: still 6% boundary atoms...

# How can we handle limited system size?

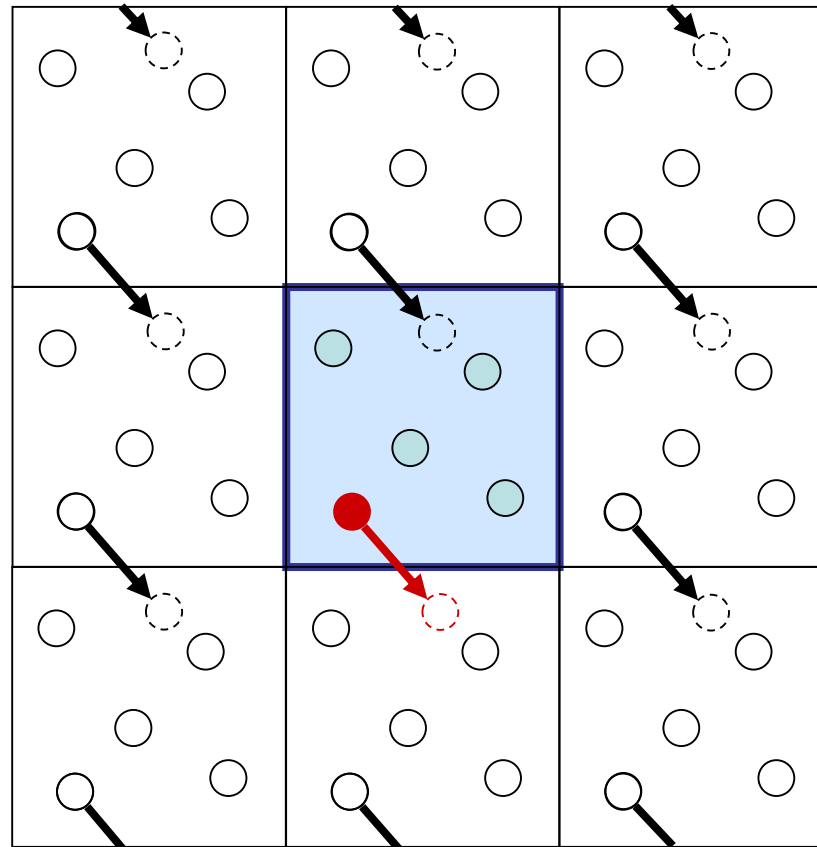
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- We try to get information about the macroscopic system.
- But due to computational limitations we can only handle system sizes of a few nm.
- This could lead to severe boundary effects.
- We have to find boundary conditions that mimic the infinite bulk surrounding our model system.

 Periodic boundary conditions

# Periodic boundary conditions

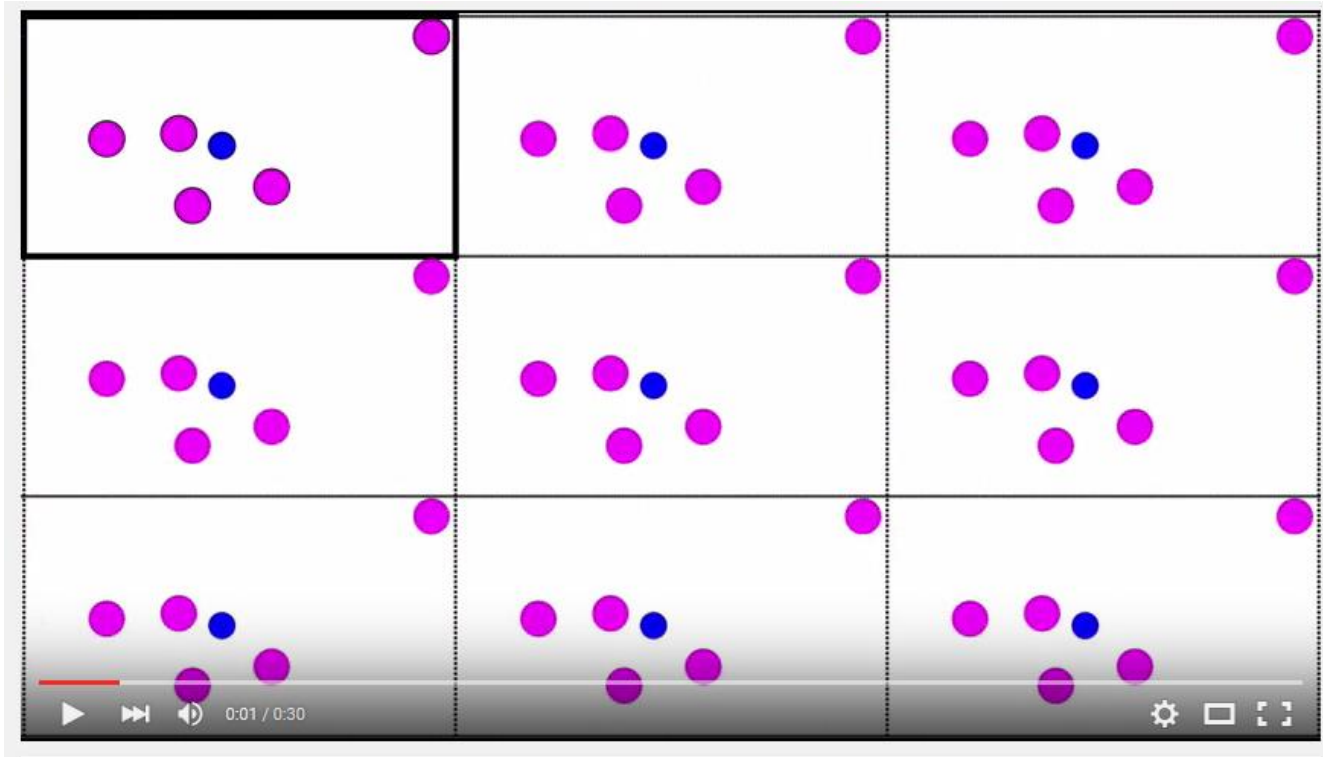
Central box surrounded by its eight images in 2D (26 in 3D) to mimic infinite bulk phase



If a particle leaves the central cell, an image particle enters from an adjacent cell.

Simulation box: simulation with five particles

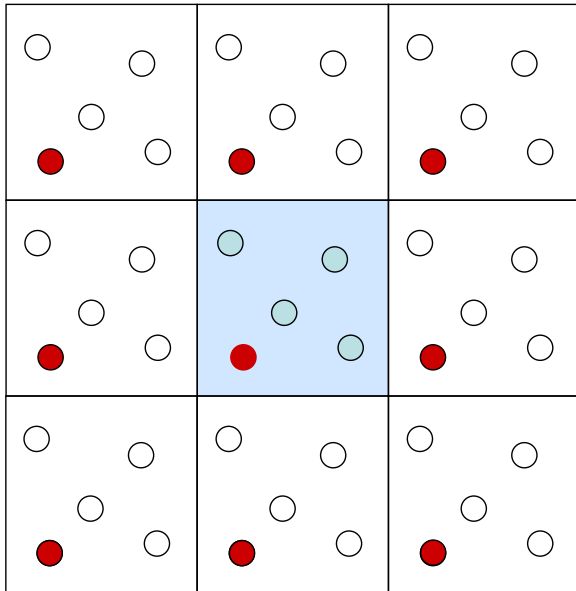
# Demonstration of pbc



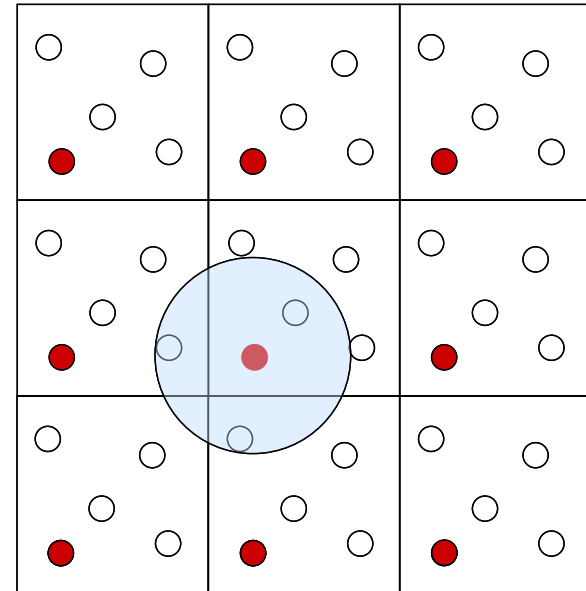
- <https://www.youtube.com/watch?v=5qdNafdyaG0>
- Better as interactive: [http://www.eng.buffalo.edu/~kofke/applets/dak\\_pbcCubic.html](http://www.eng.buffalo.edu/~kofke/applets/dak_pbcCubic.html)  
(you will have to add <http://www.eng.buffalo.edu> as a trusted site to java)

# Minimum image convention

- We have to avoid that a molecule is interacting with itself.



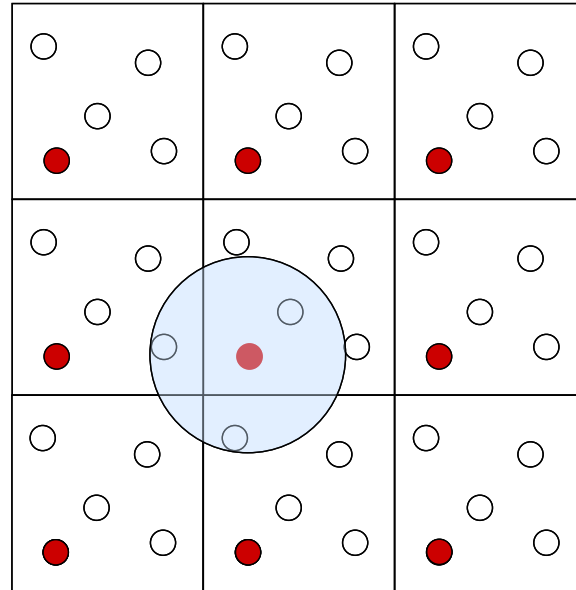
All the red particles are the same.



Interactions are only considered with the closest image.

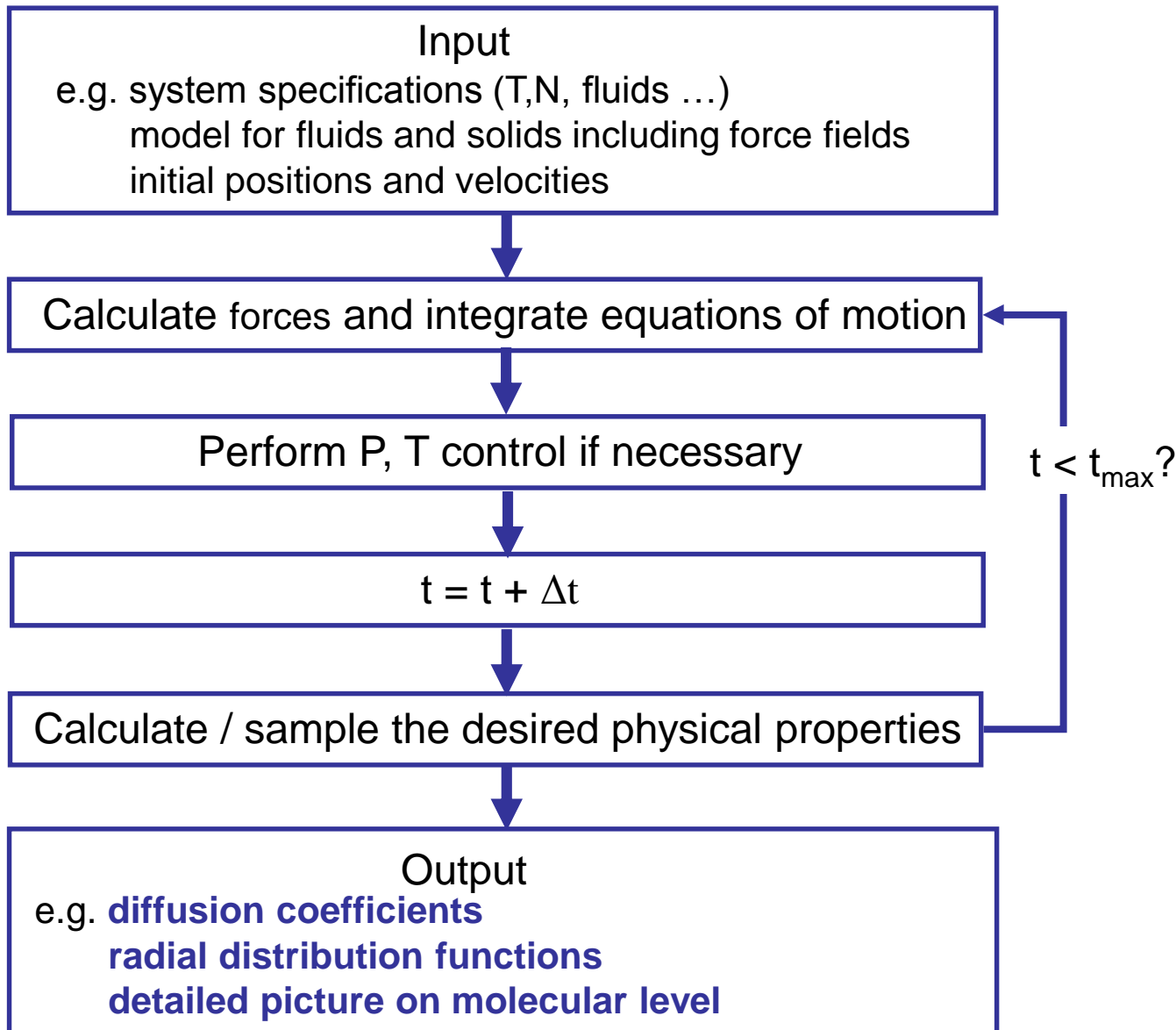
# Minimum image convention and the cut-off radius

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- The cut-off radius has to be smaller than half the box length or the minimum image convention is violated!

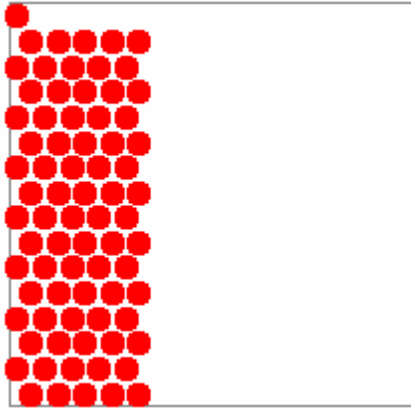
# Setting up an MD simulation



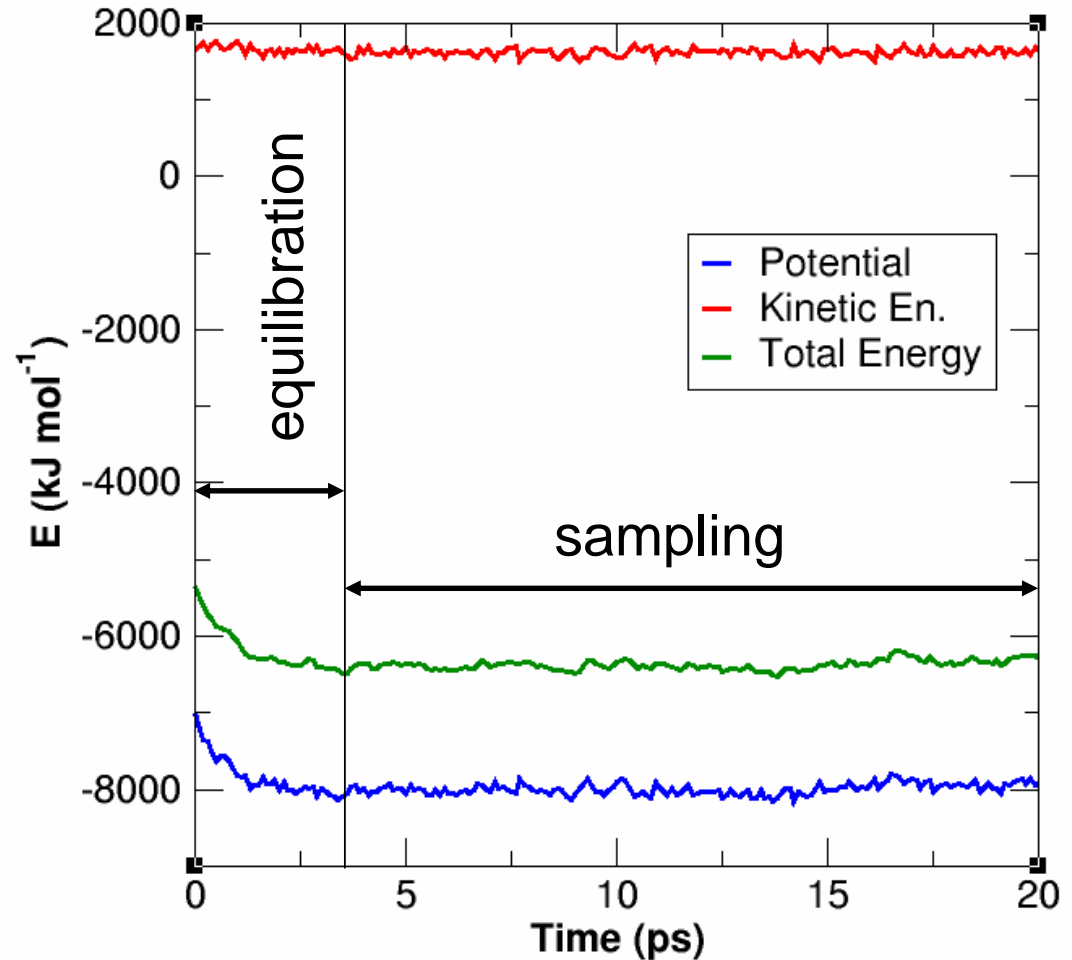
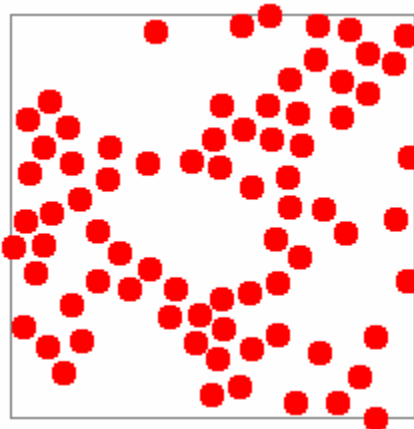
- Without any additional control measure, MD in microcanonical ensemble (NVE constant).
- A thermostat and a barostat can be used to run the simulation at constant T and P.

# Sampling should only start once system has equilibrated

Initial configuration



An equilibrium configuration





# Run MD

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- <http://rheneas.eng.buffalo.edu/wiki/LennardJones>

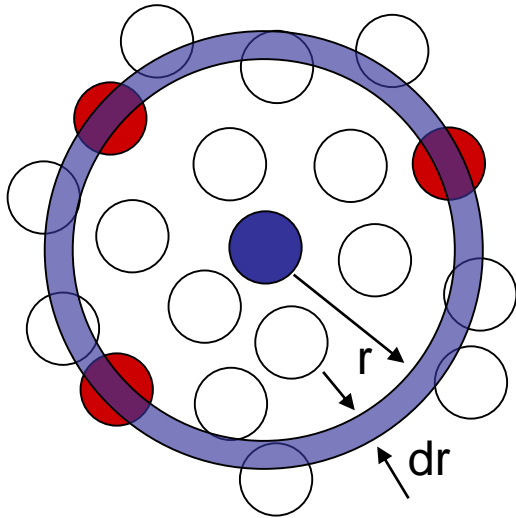
Properties calculated:

- Velocity distribution (read more about Maxwell Boltzmann distribution on webpage)
- Kinetic and potential energy
- Radial distribution function
- Mean square displacement



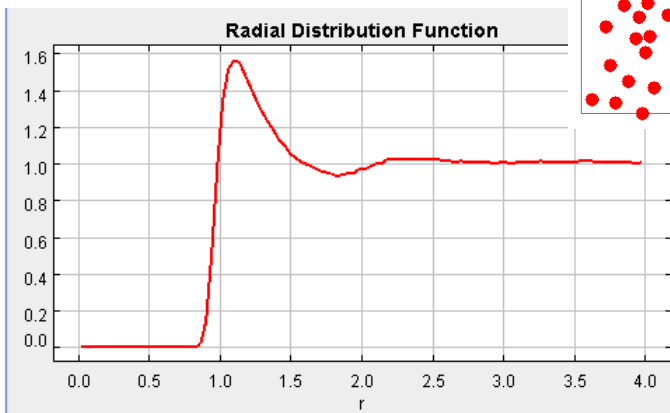
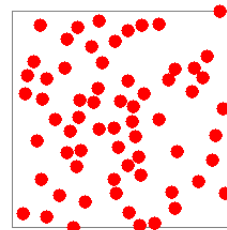
Have a play!

# Sampling – radial distribution function

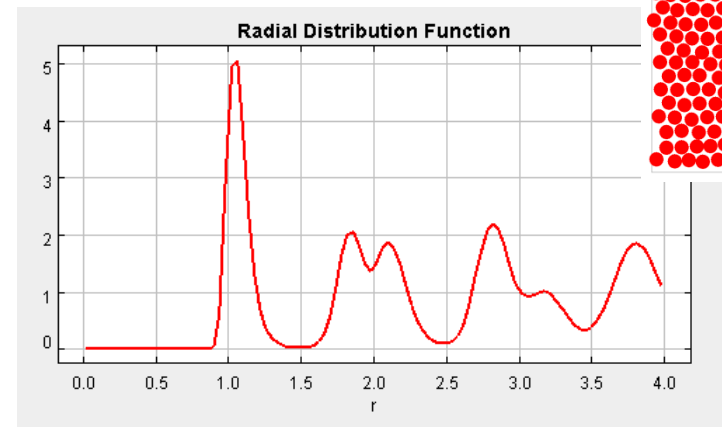
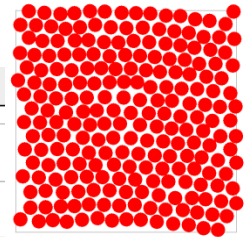


- Gives information about the structure
- “Given that I have one atom at some position, how many atoms can I expect to find at a distance  $r$  away from it?”
- the rdf can be measured experimentally, using neutron-scattering techniques

Gas like



Solid like



# Sampling – self diffusion coefficient

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- How far will a molecule travel in a given time interval?
- Mean square displacement:

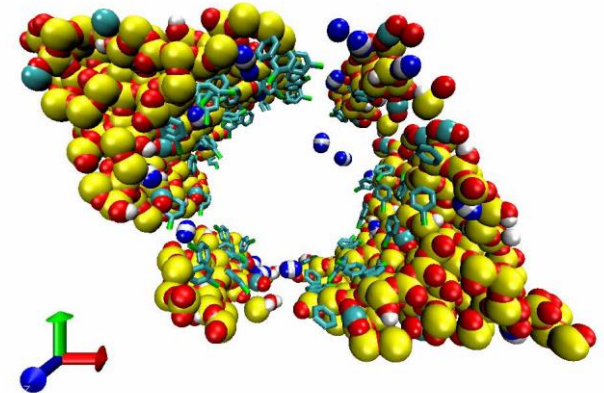
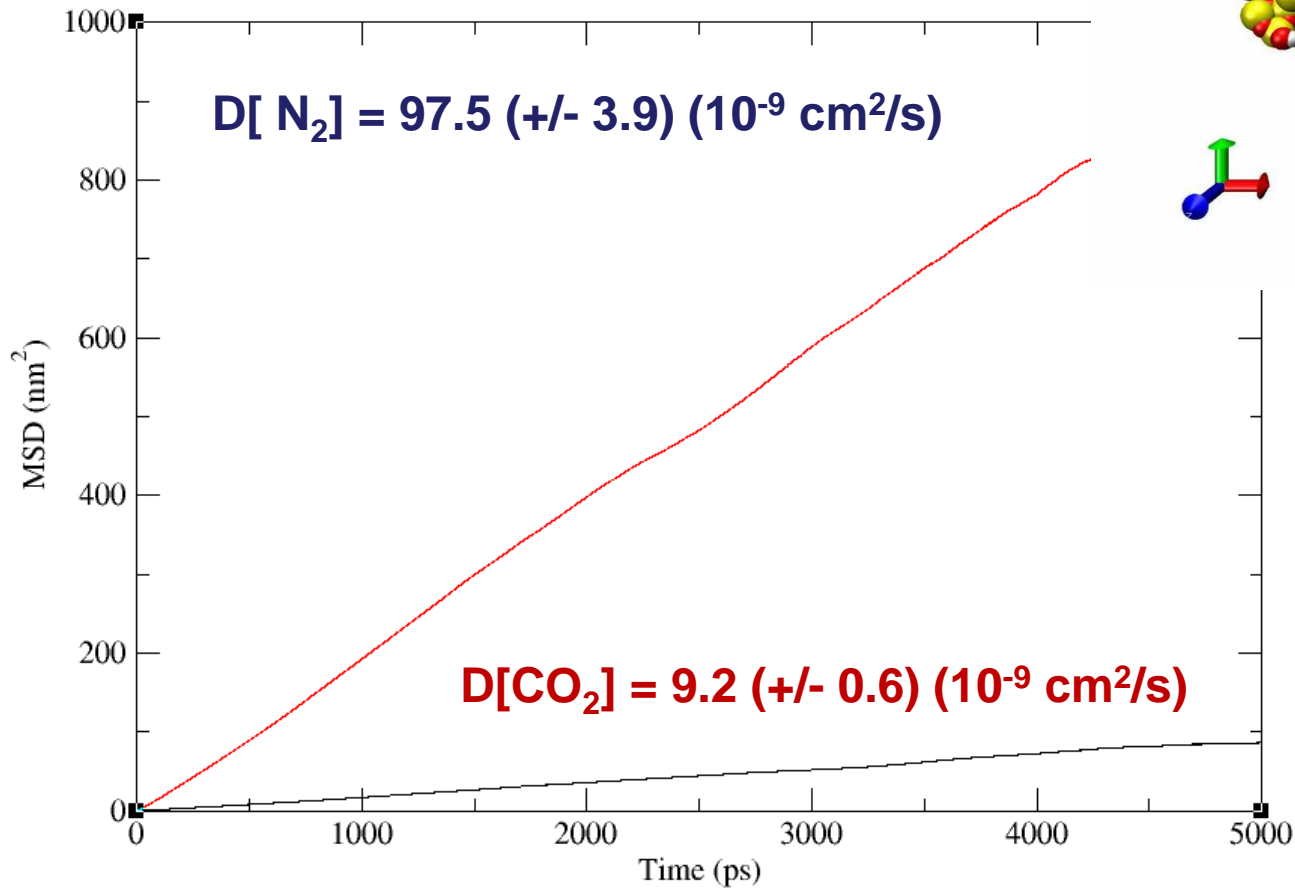
$$msd(t) = \langle \Delta r_i(t)^2 \rangle = \langle (r_i(t) - r_i(0))^2 \rangle$$

- Related through Einstein equation to macroscopic self-diffusion (= Brownian motion, no external driving force)

$$\frac{\partial \langle \mathbf{r}^2(t) \rangle}{\partial t} = 2d^{sys} D_{self}$$

- bulk systems:  $d^{sys} = 3$ , slit-like pores:  $d^{sys} = 2$ , cylindrical pores:  $d^{sys} = 1$

# Mean square displacement for flue gases in MCM-41



# References

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- D. Frenkel, B. Smit “Understanding Molecular Simulation” 2nd Editions, Academic Press, 2002
- J. M. Haile “Molecular Dynamics Simulation. Elementary Methods”, Wiley, 1992
- [http://reaktiveplasmaen.ruhr-uni-bochum.de/index.php?option=com\\_content&view=category&layout=blog&id=86&Itemid=157](http://reaktiveplasmaen.ruhr-uni-bochum.de/index.php?option=com_content&view=category&layout=blog&id=86&Itemid=157)